Plasma Cholesterol–Induced Lesion Networks Activated before Regression of Early, Mature, and Advanced Atherosclerosis

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Abstract

Plasma cholesterol lowering (PCL) slows and sometimes prevents progression of atherosclerosis and may even lead to regression. Little is known about how molecular processes in the atherosclerotic arterial wall respond to PCL and modify responses to atherosclerosis regression. We studied atherosclerosis regression and global gene expression responses to PCL (≥80%) and to atherosclerosis regression itself in early, mature, and advanced lesions. In atherosclerotic aortic wall from Ldlr+/−/ApoB100/100 and Mttp−/−/Mx1-Cre mice, atherosclerosis regressed after PCL regardless of lesion stage. However, near-complete regression was observed only in mice with early lesions; mice with mature and advanced lesions were left with regression-resistant, relatively unstable plaque remnants. Atherosclerosis genes responding to PCL before regression, unlike those responding to the regression itself, were enriched in inherited risk for coronary artery disease and myocardial infarction, indicating causality. Inference of transcription factor (TF) regulatory networks of these PCL-responsive gene sets revealed largely different networks in early, mature, and advanced lesions. In early lesions, PPARγ was identified as a specific master regulator of the PCL-responsive atherosclerosis TF-regulatory network, whereas in mature and advanced lesions, the specific master regulators were ML5S and SRSF10/XRN2, respectively. In a THP-1 foam cell model of atherosclerosis regression, siRNA targeting of these master regulators activated the time-point-specific TF-regulatory networks and altered the accumulation of cholesterol esters. We conclude that PCL leads to complete atherosclerosis regression only in mice with early lesions. Identified master regulators and related PCL-responsive TF-regulatory networks will be interesting targets to enhance PCL-mediated regression of mature and advanced atherosclerotic lesions.

Introduction

Atherosclerosis, primarily in coronary artery disease (CAD) or carotid stenosis, is the main cause of myocardial infarction (MI) and stroke, which together are responsible for more than 30% of deaths worldwide [1]. Although the extent of atherosclerosis in the arterial bed is an unreliable marker of risk for future events, advanced atherosclerotic plaques are present in nearly all cases of MI and in most cases of stroke. It is therefore important to prevent early harmless atherosclerotic lesions from progressing to rupture-prone plaques, and if possible, to induce regression of advanced atherosclerosis into more stable forms [2].

Drugs that lower LDL cholesterol, such as statins, slow atherosclerosis progression and reduce morbidity and mortality
Cholesterol-Responsive Regression Gene Networks

Author Summary

The main underlying cause of heart attacks and strokes is atherosclerosis. One strategy to prevent these often deadly clinical events is therefore either to slow atherosclerosis progression or better, induce regression of atherosclerotic plaques making them more stable. Plasma cholesterol lowering (PCL) is the most efficient way to induce atherosclerosis regression but sometimes fails to do so. In our study, we used a mouse model with elevated LDL cholesterol levels, similar to humans who develop early atherosclerosis, and a genetic switch to lower plasma cholesterol at any time during atherosclerosis progression. In this model, we examined atherosclerosis gene expression and regression in response to PCL at three different stages of atherosclerosis progression. PCL led to complete regression in mice with early lesions but was incomplete in mice with mature and advanced lesions, indicating that early prevention with PCL in individuals with increased risk for heart attack or stroke would be particularly useful. In addition, by inferring PCL-responsive gene networks in early, mature and advanced atherosclerotic lesions, we identified key drivers specific for regression of early (PPARG), mature (MLLS) and advanced (SRFS10/XRN2) atherosclerosis. These key drivers should be interesting therapeutic targets to enhance PCL-mediated regression of atherosclerosis.

from MI and stroke by 30–45% [3–5]. More potent statin regimens can even cause atherosclerosis regression [6–8] but sometimes have severe side effects. Although statins and lifestyle changes reduce the risk for secondary cardiovascular events [9], mortality from MI and stroke are still increasing [1]. About 10% of persons at increased risk for CAD/MI have elevated plasma cholesterol levels, making them eligible for primary statin treatment. The extent to which plasma cholesterol lowering (PCL) benefits healthy persons who are at increased risk for CAD/MI and have relatively normal plasma LDL-cholesterol levels is unclear [10,11]. Vulnerable atherosclerotic lesions may respond better to PCL (i.e., leading to regression and more stable plaques) in some cases than in others, depending on inherited genetic and environmental co-factors within the plaque. In part, these factors are likely reflected in gene expression patterns within the plaque [12]. A better understanding of such changes in response to PCL at different stages of plaque development is necessary to define key genes that in themselves or in parallel with PCL help improve atherosclerosis regression.

To effectively study atherosclerosis regression, the use of animal models is required. In earlier studies of atherosclerosis regression, mainly mouse models were used. Among these models were wildtype normolipidemic mice transplanted with atherosclerotic arterial segments from APOE−/− mice [13–18], APOE−/− mice treated with apoe-C-encoding adenoaviral vectors [19], LDL−/− mice treated with an microsomal triglyceride transfer protein (MTP) inhibitor [20], and mice that have a plasma lipid profile similar of that of hypercholesterolemia (LDL−/− ApoE0/0) and a genetic switch to block hepatic synthesis of lipoproteins and thereby lower plasma lipoproteins (MTPfl/fl×lox/lox Mx1-Cre) [21–23]. These studies established that PCL leads to atherosclerosis regression. mRNA profiling of atherosclerotic lesions before and after regression led to the identification of several candidate target genes that may mediate atherosclerosis regression after PCL.

However, some important aspects of atherosclerosis regression were overlooked in these studies [13–23]. First, the main focus was to identify individual atherosclerosis genes. In contrast, we believe that mRNA profiles are best interpreted by inferring groups of functionally linked genes in disease networks [24,25]. Another concern relates to the interpretation of molecular changes (reflected by gene expression) in atherosclerotic lesions before, during, and after regression. Typically, atherosclerosis regression candidate genes were identified by comparing mRNA profiles of lesions isolated before and after regression. In our experience, most genes identified in this fashion reflect morphological changes in the atherosclerotic plaque, such as shrinking of the lesion and alterations in the relative cell type composition. Such changes are likely a response to, but not a cause of, atherosclerosis regression. Finally, in a study of gene expression patterns during atherosclerosis progression [12], we observed that the extent of gene expression changes in the atherosclerotic lesions drastically expands and varies as atherosclerosis progresses. Thus, it is highly likely that gene targets to improve PCL-mediated atherosclerosis regression will vary with the stage and severity of the lesions.

In this study, we identified PCL-responsive atherosclerosis genes and their interactions in networks before regression at three stages of atherosclerosis development. We then compared these genes with those responding to the atherosclerosis itself. Specifically, we analyzed the extent, composition, and mRNA profiles of early, mature, and advanced atherosclerotic aortic lesions from Ldlr−/− Apob100/100 Mttpfl/fl×lox/Mx1-Cre mice [22] immediately before and after Cre-induced PCL and at 10 and 20 weeks after PCL.

Results

Study Mice and PCL

To study regression of atherosclerosis at different stages, we lowered plasma lipoprotein levels in Ldlr−/− Apob100/100 Mttpfl/fl×lox/Mx1-Cre mice by recombining the floxed gene (Mttpfl/fl×lox/Mx1-Cre) with polyinosinic-polycytidylic acid (PiPc) injections after 30, 40, and 50 weeks of atherosclerosis progression (i.e., age of the mice). PiPc injections in Mttpfl/fl×lox/Mx1 mice do not affect plasma cholesterol levels or transcriptional activity in the arterial wall [12]. After recombination of microsomal triglyceride transfer protein (Mttp), plasma total cholesterol levels were reduced by 80–95%, HDL-cholesterol 30–60% and, triglyceride levels by 40–60%; plasma glucose levels were generally unaffected (Table 1 and Table S1). Plasma cholesterol (both total and HDL) and triglyceride levels were reduced to similar levels in mice with early (week 30), mature (week 40), and advanced (week 50) lesions, and remained at these levels throughout the regression study period (10 and 20 weeks after Mttp recombination; Table 1 and Table S1). In littermate Ldlr−/− Apob100/100 Mttpfl/fl×lox/Mx1-Cre mice injected with PBS (controls) and sacrificed at 20, 30, 40, 50, and 60 weeks, plasma cholesterol and triglyceride levels were unaffected (Table 1). Since Mttp recombination primarily affected plasma cholesterol levels (e.g., LDL-cholesterol), we will refer to plasma lipid lowering as PCL.

Regression Responses to PCL at Different Stages of Atherosclerosis Progression

The extent of atherosclerosis regression and progression was assessed by en face analysis of the lesion surface area of pinned-out aortic trees stained with Sudan IV. Early lesions in the aortic arch were small and had distinct borders (Figure 1A and 1B). Mature and advanced lesions were substantially larger but still had distinct borders, with small lesions appearing in the ascending aorta.

Atherosclerosis regression occurred at all lesion stages after PCL. In mice with early lesions (30 weeks), PCL led to near-complete regression after 20 weeks (Figure 1A and 1B), from 4.3% of surface area to 0.5% (down by 88%) (P = 0.0003). However, in
mice with mature lesions (PCL at 40 weeks) and advanced lesions (PCL at 50 weeks), regression was substantial but never complete. During the first 10 weeks of PCL, mature lesions shrank from 12.6% to 4.1% of surface area \( (P=5.7 \times 10^{-5}) \) and advanced lesions from 15.2% to 6.2% \( (P=7 \times 10^{-7}) \). During the last 10 weeks of PCL, however, there was little further regression. Mature lesions shrank from 4.1% to 3.5% of surface area \( (P=0.6) \) and advanced lesions from 6.2% to 6.0% \( (P=0.0) \) \( (P=1.3 \text{ to } 72, P<0.001) \). In comparison, after 20 weeks of regression, plaque stability scores had increased only 13-fold in mature lesions \( (0.3 \text{ to } 3.4, P<0.001) \) and 54-fold higher after 20 weeks \( (1.3 \text{ to } 72, P<0.001) \). Clearly, plaque stability is generally improved by PCL-induced regression; however, in mice with mature and advanced lesions, the baseline score was substantially lower and the improvement much less than in mice with early lesions. Thus, the greatest gain in plaque stability is achieved by PCL in mice with early lesions.

### Plaque Stability after Regression

**Plaque Composition after Regression**

Although regression of the extent of atherosclerosis (atherosclerosis burden) increases plaque stability as reflected by the cellular, collagen, and lipid composition of the plaque, compositional changes do not always parallel changes in atherosclerosis burden. Therefore, we compared the histological features of aortic root sections isolated before and after PCL (Figure 2).

### Table 1. Plasma cholesterol, triglyceride and glucose concentrations in the study mice at sacrifice.

<table>
<thead>
<tr>
<th>Time point</th>
<th>Plasma levels (mg/dl)</th>
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<tbody>
<tr>
<td></td>
<td>Before PCL</td>
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<tr>
<td></td>
<td>1 week</td>
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<tr>
<td>20 weeks</td>
<td></td>
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<tr>
<td>Cholesterol</td>
<td>220 ± 29</td>
</tr>
<tr>
<td>Triglycerides</td>
<td>85.2 ± 18</td>
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<tr>
<td>Glucose</td>
<td>407 ± 86</td>
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<tr>
<td>(n = 8)</td>
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<tr>
<td>30 weeks</td>
<td></td>
</tr>
<tr>
<td>Cholesterol</td>
<td>254 ± 38</td>
</tr>
<tr>
<td>Triglycerides</td>
<td>76.5 ± 10</td>
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<tr>
<td>Glucose</td>
<td>394 ± 78</td>
</tr>
<tr>
<td>(n = 6)</td>
<td>(n = 6)</td>
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<tr>
<td>40 weeks</td>
<td></td>
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<tr>
<td>Cholesterol</td>
<td>264 ± 91</td>
</tr>
<tr>
<td>Triglycerides</td>
<td>72.5 ± 10</td>
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<tr>
<td>Glucose</td>
<td>377 ± 134</td>
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<tr>
<td>(n = 9)</td>
<td>(n = 9)</td>
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<tr>
<td>50 weeks</td>
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<tr>
<td>Cholesterol</td>
<td>226 ± 48</td>
</tr>
<tr>
<td>Triglycerides</td>
<td>97.2 ± 22</td>
</tr>
<tr>
<td>Glucose</td>
<td>373 ± 64</td>
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<tr>
<td>(n = 9)</td>
<td>(n = 9)</td>
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<tr>
<td>60 weeks</td>
<td></td>
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<tr>
<td>Cholesterol</td>
<td>224 ± 50</td>
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<tr>
<td>Triglycerides</td>
<td>95.1 ± 47</td>
</tr>
<tr>
<td>Glucose</td>
<td>346 ± 125</td>
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<tr>
<td>(n = 9)</td>
<td>(n = 9)</td>
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**Values are mean ± SD.**

*P<0.05,

**P<0.001 vs. before PCL.
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Over 20 weeks of regression, the most robust changes in plaque composition were in neutral lipids identified by Oil-Red-O staining (Figure 2A) and in the percentage of lesion macrophages identified by staining for CD68 (Figure 2B). Oil-Red-O staining decreased from 5.6% to 2.7% of surface area in early lesions, from 12.6% to 5.1% in mature lesions, and from 22.6% to 5.1% in advanced lesions \( (P<0.001) \). Similarly, the percentage of lesion macrophages decreased from 5.1% to 0.2% in early lesions, from 7.1% to 0.5% in mature lesions, and from 10.3% to 0.8% in advanced lesions \( (P<0.001) \). In early lesions, the extensive reduction in the percentage of macrophages \( (5.1\% \text{ to } 0.2\%) \) was paralleled by near-complete regression after 20 weeks of PCL (Figure 1A). Of note, between weeks 10 and 20 of PCL, the percentage of macrophages in advanced lesions decreased from 2.5% to 0.8% \( (P<0.05) \) despite no further reduction in the extent of lesions (Figure 1A).

In early lesions, PCL increased the collagen content by 80–130% \( (P<0.01 \text{ at } 10 \text{ and } 20 \text{ weeks}) \). In mature lesions, the collagen content was unaffected by PCL. In advanced lesions, collagen content decreased by about 30% 10 weeks after PCL \( (P<0.05) \) and remained at this level at 20 weeks. The pattern of changes in the lesion content of smooth muscle cells \( (\text{SM22a-positive}) \) was similar to that of collagen content; however, owing to higher variation, none of these changes were statistically significant (data not shown).

**Table 1. Plasma cholesterol, triglyceride and glucose concentrations in the study mice at sacrifice.**

**Cholesterol-Responsive Regression Gene Networks**

For mRNA profiling studies, PCL was again induced in mice with early (30 weeks), mature (40 weeks), and advanced (50 weeks) lesions. Atherosclerotic aortic arch was isolated for RNA isolation immediately before and after PCL and after 10 weeks of regression. Affymetrix arrays \( (\text{Mouse Gene 1.0 ST}) \) were used for mRNA profiling.

First, to assess atherosclerotic arterial wall genes that respond to the PCL before atherosclerosis regression \( (i.e., \text{PCL-responsive gene set}) \), we compared mRNA profiles immediately before and after PCL (Figure 3A, Tables S2, S3, S4). Since the time between “immediately before and after PCL” is about 1 week, we observed no morphological changes in the lesion composition, including the percentages of different cell types. As a consequence, the PCL-responsive gene sets represent genes with primary changes in their
A

% lesion area

25
20
15
10
5
0

20 30 40 50 60 70
Age (weeks)

B

Before PCL

After PCL for

30 weeks

10 weeks

20 weeks

40 weeks

50 weeks
expression levels rather than changes due to alterations in the cellular composition of the plaque.

Next, to identify atherosclerotic arterial wall genes whose expression changed during atherosclerosis regression (i.e., regression-reactive gene sets), we compared mRNA profiles immediately after PCL and after 10 weeks of regression (Figure 3B, Tables S5, S6, S7). In contrast to PCL-responsive gene sets, changes in the expression of many genes in the regression-reactive set likely reflect changes in the cellular composition of the plaque.

As atherosclerotic lesions develop, their molecular complexity increases [12]. So it was not surprising that the number of PCL-responsive genes increased from 261 transcripts (corresponding to 238 mouse genes) in early lesions, to 1752 transcripts (1306 genes) in mature lesions and to 2702 transcripts (2231 genes) in advanced lesions (Figure 3A, Figure 4A, Tables S2, S3, S4). Similarly, the number of regression-reactive genes increased from 30 transcripts (24 genes) in early lesions, to 1902 transcripts (1556 genes) in mature lesions, and up to 8569 transcripts (6273 genes) in advanced lesions (Figure 3B, Figure 4B, Tables S5, S6, S7). These observations suggest that the PCL responses of the atherosclerotic lesions become increasingly complex as atherosclerosis progresses and are mirrored by a greater complexity in the regression response.

Interestingly, the PCL-responsive gene sets were largely unique at each time point/stage of atherosclerosis; the fraction of unique genes was 24%, 66%, and 84% in early lesions, mature, and advanced lesions, respectively (Figure 4A). Of PCL-responsive genes in early lesions, 66% were uniquely shared with PCL-responsive genes in mature lesions but only 5% with advanced lesions (Figure 4A). In contrast, regression-reactive gene sets were more shared between stages of atherosclerosis progression; all regression-reactive genes in early lesions were present in the reactive gene sets of mature and advanced lesions, and 50% of the reactive gene set in mature lesions was present in advanced lesions (Figure 4B). Thus, PCL-responsive atherosclerosis genes largely vary with the stage of atherosclerosis, whereas regression-reactive genes sets expand as atherosclerosis progresses.

Enrichment of Inherited Risk for CAD/MI of the PCL-Responsive and Regression-Reactive Gene Sets

Genes that are causally linked to CAD/MI provide key information about the risk of developing the disease, whereas genes reacting to a disease typically do not [25]. To examine the causal relationships of the PCL-responsive and regression-reactive gene sets to atherosclerosis regression, we identified single nucleotide polymorphisms (SNPs) affecting the expression of the human orthologs of those genes (Tables S8, S9, S10, S11, S12, S13) and determined the extent to which these expression SNPs (eSNPs) carry more risk for CAD/MI than would be expected by chance. For this purpose, we used a well-established genome-wide association (GWA) study of CAD/MI, MIGen [28].

eSNPs affecting the expression of genes in the PCL-responsive gene sets in early, mature, and advanced atherosclerosis were all risk-enriched compared to 5000 randomly selected equally sized sets of SNPs (early, 2.0-fold, P = 3.1×10^{-14}; mature, 1.4-fold, P = 6.8×10^{-15}; advanced, 1.5-fold, P = 1.3×10^{-7}). In contrast, eSNPs affecting the expression of genes in the regression-reactive gene sets were not (early/mature/advanced, <1.1-fold, P > 0.05). These results support the notion that PCL-responsive genes are causally linked to regression of atherosclerosis and that regression-responsive genes are, as hypothesized, secondary.

PCL-Responsive TF-Regulatory Gene Network of Early Atherosclerosis

From the standpoint of understanding genes that drive atherosclerosis regression, genes that respond acutely to PCL and are risk-enriched for CAD/MI—that is, the PCL-responsive gene sets of early, mature, and advanced atherosclerosis—were considered the most interesting.

According to GO analysis of the PCL-responsive gene set of early lesions (n = 261), the top cellular function was lipid metabolism and the top disease category was connective tissue disorder (Table S14). Next, to investigate the connectivity of the human orthologs of the PCL-responsive genes of early lesions (n = 215), we inferred the TF-regulatory gene network by using mRNA profiles from blood macrophages of CAD patients [29]. Fifty-three of 215 human orthologs belonged to the TF-regulatory network (Figure 5A, P < 0.0051, Table S8). Peroxisome proliferator-activated receptor alpha and gamma (PPARA, PPARG) were master regulators (highly connected genes) in this network, with 17 and 13 edges, respectively (Table 2).

To validate the PCL-responsive TF-regulatory gene network in early lesions, including its key master regulators, we used a THP-1 regression model. In brief, THP-1 cells were differentiated into macrophages in vitro and incubated with acetylated-LDL (Ac-LDL) to form foam cells. The cells were then treated with siRNA (to silence the key master regulators) or mock treated (controls) and examined for effects on the expression levels of network genes and cholesterol ester (CE) accumulation. CE levels were assessed from lipids in the THP-1 foam cells after siRNA silencing of the master regulator and compared CE levels in mock-treated cells. If CE accumulation increased, the master regulator was judged to promote atherosclerosis regression. If CE accumulation decreased, the master regulator was judged to prevent regression. To assess gene expression in THP-1 foam cells, RNA isolated after silencing was analyzed with an Agilent Human Custom Gene Expression Microarray; the degree of silencing of master regulators was assessed by RT-PCR.

When PPARG was silenced, 28% (15/53) of the PCL-responsive network genes in early atherosclerosis were affected (down- or up-regulated at a false-discovery rate (FDR)<0.1; Table 3 and Tables S8 and S17). A hypergeometric test (Methods) showed that the effects of silencing PPARG were specific to the 53 genes in the TF-regulatory gene network of early lesions (P = 0.020, Table 4). In the THP-1 foam cell model, CE accumulation increased by 12% (P = 0.001) after silencing of PPARG (Table 5).

PCL-Responsive TF Regulatory Gene Network of Mature Atherosclerosis

According to GO analysis of the PCL-responsive gene set (n = 1752) of mature lesions, the top molecular and cellular function was lipid metabolism (Table S15) and the top disease categories were connective tissue disorder and metabolic disease (Table S15). Next, we investigated the connectivity of these genes by

Cholesterol-Responsive Regression Gene Networks

Figure 1. Atherosclerosis progression in Ldlr−/− Apob100/100 Mttpbox/box mice and regression in Ldlr−/− Apob100/100 Mttp−/− mice. (A) Atherosclerosis progression and regression curves. Values are surface lesion area (mean ± SD), assessed by Sudan IV staining, as a percentage of the total area of pinned-out aortas. n = 4–10 per time point. Lesion development in controls without PCL (●) (P < 0.001 vs. 30 weeks) and in mice after PCL started at week 30 (▲), 40 (◆), or 50 (□). Changes in lesion area between 10 and 20 weeks of low plasma cholesterol were significant only in mice with early lesions (PCL at 30 weeks, P = 0.05). *P < 0.05, ***P < 0.001. (B) Representative aortic trees (above) with magnified arches (below) stained with Sudan IV before and 10 and 20 weeks after PCL at 30, 40 and 50 weeks. Graphs indicate degree of regression at that PCL time-point (red). doi:10.1371/journal.pgen.1004201.g001
Figure 2. Immunohistochemical characteristics of representative frozen sections of aortic roots from Ldlr−/− Apob100/100 MttpFlox/flox and Ldlr−/− Apob100/100 MttpΔΔ mice. (A–C) Average percent stained area of total aortic root area (right) and representative stained aortic roots (left). Bars indicate SD. Original magnification, 50×. *P<0.05, **P<0.01, and ***P<0.001. (A) Oil-Red-O staining (n = 6–9 per group). (B) CD68 staining (n = 5–8 per group). (C) Sirius Red staining (collagen) (n = 3 per group). (D) Mean plaque stability score (arbitrary units). Bars indicate SD. Average plaque stability scores were divided by total extent of plaque burden to assess stability per mouse (not individual plaques). Inset: magnifications of plaque stability score/mouse at 30, 40, 50, and 60 weeks before regression.

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the only key master regulator that was specific for the mature point).
immediately after PCL with those at 10 weeks after PCL (10 per time
high-cholesterol littermate controls sacrificed at 30, 40 and 50 weeks
compared transcriptional profiles (4–6 per time point) of PBS-treated,
sets. Colors indicate when PCL was started: green, 30 weeks; yellow, 40
weeks; red, 50 weeks. (A) To define the PCL-responsive gene sets, we compared transcriptional profiles (4–6 per time point) of PBS-treated, high-cholesterol littermate controls sacrificed at 30, 40 and 50 weeks with those immediately after PCL. (B) To define the regression-reactive gene sets, we compared transcriptional profiles (3–6 per time point) immediately after PCL with those at 10 weeks after PCL (10 per time point).
doi:10.1371/journal.pgen.1004201.g003

inferring the TF-regulatory gene network, again using the mRNA profiles from blood macrophages of CAD patients [29]. Of 1087 human orthologs (corresponding to 1306 mouse genes, Table S9), 185 were part of the inferred TF-regulatory gene network (P<0.0013, Figure 5B, Table S9, Figure S1). The master regulators of this network were high mobility group box 2 (HMGB2), adenosine A2a receptor (ADORA2A), telomeric repeat binding factor 1 (TERF1), and mixed lineage leukemia 5 (MLL5), with 61, 59, 55 and 38 connections, respectively (Table 2).

To validate the PCL-responsive TF-regulatory gene network and its key master regulators in mature lesions, we again used a THP-1 foam cell regression model. After silencing of ADORA2A, 31% (58/185) of the mature network genes were affected; after silencing of both ADORA2A and MLL5, 36% (67/185) were affected (FDR<0.1, Table 3, Table S9 and Table S17). MLL5 was the only key master regulator that was specific for the mature atherosclerosis network according to the hypergeometric test (P=0.0059, Table 4). After MLL5 silencing, CE accumulation in the THP-1 foam cell model increased 21% (P=0.01, Table 5).

PCL-Responsive TF Regulatory Gene Network of Advanced Atherosclerosis

According to GO analysis of the PCL-responsive gene set (n=2702) in advanced lesions, the top molecular and cellular functions were protein synthesis and degradation (Table S16) and the top disease categories were immunological disease and cardiovascular disease (Table S16). Next, we investigated the connectivity of these genes by inferring the TF-regulatory gene network, using the same mRNA profiles from blood macrophages of CAD patients [29] (Figure 5C). Of 1865 human orthologs (corresponding to 2231 mouse genes, Table S10), 379 were part of the inferred regulatory network (P<0.00042, Figure 5C, Table S10, Figure S2). The master regulators in this network were serine/arginine-rich splicing factor 10 (SRSF10), 5′–3′-exoribonuclease 2 (XRN2), and HMGB1, with 71, 67, and 62 connections, respectively (Table 2).

In the THP-1 foam cell regression model, silencing of both SRSF10 and MLL5 affected 22% (83/379) of the advanced network genes (FDR<0.05, Table 3, Table S10 and Table S17). Silencing of SRSF10 and MLL5 individually affected 19% and 15%, respectively, of the advanced lesion network genes. Both SRSF10 and MLL5 were specific master regulators for the advanced atherosclerosis network (P=0.005, P=0.040, respectively, Table 4). In the THP-1 foam cell model, CE accumulation decreased by 17% (P=0.0008) after silencing of SRSF10 and by 15% (P=0.003) after silencing of MLL5 (Table 5).

Discussion

PCL decreases the risk for clinical complications of atherosclerosis, but individual responses vary, from slowing or preventing further progression to inducing regression. This study of a mouse model with human-like plasma lipoprotein profile and advanced atherosclerotic lesions showed that atherosclerosis regression occurs regardless of the lesion stage at which PCL is induced. However, as lesions progress, they become increasingly resistant to PCL. In mice with early lesions, PCL led to a complete regression and nearly healthy arteries (plaque stability score >70 after 20 weeks of regression). In mice with mature lesions, the regression was incomplete, leaving plaque remnants that were substantially smaller but relatively stable (stability score <10). And in mice with advanced lesions, the plaque remnants were even less stable (stability score <5). Thus, if early atherosclerosis in humans is equally sensitive to plasma cholesterol levels, patients at increased risk for CAD and MI would benefit greatly from PCL while their lesions are still in the early stage.

The increasing resistance to PCL as atherosclerotic plaques progress suggests that specific molecular processes in atherosclerosis regulate PCL sensitivity and thus the response to atherosclerosis regression. We therefore performed mRNA-profiling immediately before and after PCL to identify PCL-responsive atherosclerosis genes and examined their interplay in TF-regulatory gene networks. Consistent with the differences in plaque sensitivity to PCL, plasma cholesterol-responsive genes in the atherosclerotic arterial wall were largely different in early, mature, and advanced lesions. In early lesions, we identified PPARG as a specific master regulator of other PCL-responsive genes that collectively led to near-complete regression. In mature and advanced plaques, we identified nonspecific master regulators (affecting both mature and advanced PCL-responsive genes in THP-1 foam cells), such as ADORA2A, HMGB1, HMGB2, and TERF1, as well as specific master regulators of partial regression in mature lesions (MLL5) and advanced lesions (SRSF10 and MLL5). In validation studies in THP-1 foam cells, siRNA targeting individual master regulators either decreased (SRSF10, MLL5) or increased (PPARG and MLL5) CE accumulation. These genes are plausible targets to improve PCL-mediated regression of mature and advanced atherosclerosis.

In studies to validate the inherited risk-enrichment [25] of the PCL-responsive and regression-reactive gene sets, we found that only PCL-responsive genes were enriched with inherited risk for CAD/MI (1.4-fold, P<6.8×10−4). The causal gene set of early atherosclerosis was especially risk enriched (2.0-fold, P=3.1×10−14), perhaps indicating that the causal gene set of early lesions precedes those of mature and advanced lesions and has a more important role in carrying inherited risk. We [12,25] and others [24] have shown that molecular processes with key roles in disease have at least some degree of risk enrichment. However, genes affected by DNA variants (i.e., eSNPs) might be
disease relevant despite not necessarily carrying inherited risk. Thus, some regression-reactive genes are likely important for atherosclerosis regression despite their lack of enrichment in inherited risk of CAD/MI. The lack of risk enrichment in the regression-reactive gene sets does not imply that every gene or pathway in these sets is irrelevant for atherosclerosis regression. For example, the regression-reactive gene sets included many genes in the transendothelial migration of leukocytes (TEM) pathway that are thought to be important in regression [19].

Interestingly, master regulatory genes did not harbor any disease-associated eSNPs according to the MIGen GWA dataset [28], although many other PCL-responsive network genes did. What is responsible for this difference? One possibility is that SNPs or mutations in genes that encode key transcription regulatory proteins (i.e., master regulators) often are deleterious and therefore are effectively eliminated by natural selection from the gene pool [30]. In support of this notion, disease risk loci identified by GWA studies so far have not yet identified key master regulators of lipid metabolism in CAD, like SREBPs, PPARs and LXR [31,32]. Instead, genes in lipid metabolism that have been identified by GWA studies, such as PCSK9, ABCG5 and ABCG8 [31,32], are, to our understanding, important modifiers but not master regulators.

Although some regression-reactive genes may contribute to atherosclerosis regression, they did not respond to PCL. Responsiveness to PCL, we believe, is key to the atherosclerosis regression response. Interestingly, PPARG was identified as a PCL-responsive master regulator of the TF-regulatory network of early lesions. Recently, a study of the same mouse model we used showed that treatment with pioglitazone (a PPARG agonist) in addition to PCL improved the inflammatory profile of CD68 cells [21]. Thus, the PPARG agonist modified the response of the atherosclerotic arterial wall to PCL. Our validation of stage-specific master regulators in the foam cell model of regression suggests that MLL5, SRSF10, and XRN2 will be useful targets for improving atherosclerosis regression after PCL in individuals with mature or even

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**Figure 4. PCL-responsive and regression-reactive gene sets of atherosclerosis regression.** Venn diagrams showing the percentage/number of differentially expressed genes at 30, 40, and 50 weeks. The colors of the circles indicate when PCL was started: green, 30; yellow, 40 weeks; red, 50 weeks. The percentage in the circles to the left represent the percentage of differentially expressed genes for that section and specific time point. The numbers in circles to the right represent numbers of differentially expressed genes. (A) The PCL-responsive gene sets consist of genes that responded immediately to PCL, initiating regression of early (30 weeks), mature (40 weeks), and advanced (50 weeks) atherosclerosis. (B) The regression-reactive gene sets consist of genes altered in lesions between immediately after PCL and 10 weeks of low plasma cholesterol levels. doi:10.1371/journal.pgen.1004201.g004
advanced lesions. Studies targeting these genes either genetically or with drugs in parallel to PCL are warranted.

Atherosclerosis regression after PCL has been investigated in several mouse models [13–23,33] and the results prompted debate about the mechanisms of regression. According to a leading theory, regression is caused by increased macrophage emigration from the plaque [13,16,18,33]. Another study suggested that the key mechanism is suppressed migration of leukocytes to the arterial wall [19]. The notion that monocyte migration is a key process in regression is supported by our transcriptional profiling data and immunohistological characteristics of atherosclerosis regression (loss of CD68-positive cells and decrease in Oil-Red-O staining). In contrast, we found that expression of chemokine (C-C motif) receptor 7 (Ccr7) and liver X receptor alpha (Lxr) was downregulated in response to atherosclerosis regression, not upregulated (not shown). These findings suggest that deactivation of TEML pathway genes, rather than increased emigration of macrophages, is more essential for atherosclerosis regression. In relation to the PCL-responsive gene sets, the TEML pathway may be a key event but is activated further downstream, since a

**Table 2.** Top hubs in the causal TF-regulatory co-expression networks inferred in human macrophages.

<table>
<thead>
<tr>
<th>Gene Symbol</th>
<th>Gene Name</th>
<th>Network Connections</th>
</tr>
</thead>
<tbody>
<tr>
<td>Top hubs week 30</td>
<td></td>
<td></td>
</tr>
<tr>
<td>PPARA</td>
<td>PPAR alpha</td>
<td>17</td>
</tr>
<tr>
<td>PPARG</td>
<td>PPAR gamma</td>
<td>13</td>
</tr>
<tr>
<td>POE8A</td>
<td>Phosphodiesterase 8A</td>
<td>12</td>
</tr>
<tr>
<td>CEBPA</td>
<td>CCAAT/enhancer-binding protein alpha</td>
<td>9</td>
</tr>
<tr>
<td>HIPK2</td>
<td>Homeodomain interacting protein kinase</td>
<td>9</td>
</tr>
<tr>
<td>Top hubs week 40</td>
<td></td>
<td></td>
</tr>
<tr>
<td>HMGB2</td>
<td>High mobility group box 2</td>
<td>61</td>
</tr>
<tr>
<td>ADORA2A</td>
<td>Adenosine A2a receptor</td>
<td>59</td>
</tr>
<tr>
<td>TERF1</td>
<td>Telomeric repeat binding factor 1</td>
<td>55</td>
</tr>
<tr>
<td>P4A</td>
<td>Protein kinase inhibitor alpha</td>
<td>48</td>
</tr>
<tr>
<td>HMGB1</td>
<td>High mobility group box 1</td>
<td>44</td>
</tr>
<tr>
<td>Top hubs week 50</td>
<td></td>
<td></td>
</tr>
<tr>
<td>SRSF10</td>
<td>Serine/arginine-rich splicing factor 10</td>
<td>71</td>
</tr>
<tr>
<td>XRN2</td>
<td>5’-3’ exoribonuclease 2</td>
<td>67</td>
</tr>
<tr>
<td>HMGB1</td>
<td>High mobility group box 1</td>
<td>62</td>
</tr>
<tr>
<td>ATF1</td>
<td>Activating transcription factor 1</td>
<td>60</td>
</tr>
<tr>
<td>BMI1</td>
<td>BMI1 polycomb ring finger oncoprotein</td>
<td>59</td>
</tr>
<tr>
<td>Common hubs weeks 30 and 40</td>
<td></td>
<td></td>
</tr>
<tr>
<td>None</td>
<td></td>
<td></td>
</tr>
<tr>
<td>Common hubs weeks 40 and 50</td>
<td>Week 40</td>
<td>Week 50</td>
</tr>
<tr>
<td>HMGB1</td>
<td>High mobility group box 1</td>
<td>44</td>
</tr>
<tr>
<td>HMGB2</td>
<td>High mobility group box 2</td>
<td>61</td>
</tr>
<tr>
<td>MLL5</td>
<td>Myeloid/lymphoid or mixed-lineage leukemia 5</td>
<td>38</td>
</tr>
</tbody>
</table>

TF, transcription factor. Common hubs >5 connections.

doi:10.1371/journal.pgen.1004201.t002
majority of these genes did not respond to PCL. In addition, our findings clearly indicate that atherosclerosis regression is too complex to be explained by changes in TEMl activity alone.

Besides migrating and emigrating, macrophages within the plaque also proliferate, affecting plaque size [34]. Specifically, at a high turnover rate, lesion macrophages can be replenished by local proliferation rather than de novo influx of monocytes [34]. How macrophage proliferation rate is affected (if at all) by PCL at different stages of atherosclerosis progression is unknown but is certainly of interest for future studies. Our findings show that enhancing atherosclerosis regression after PCL will require targeting regulatory genes at the top of the regulatory hierarchy (e.g., master regulators) rather than individual effector genes (e.g., C/EBP and Lox) or specific pathways, such as TEMl or cell proliferation.

Interestingly, even though mature and advanced plaque remnants became increasingly resistant to PCL-mediated regression, the number of CD68-positive cells decreased between weeks 10 and 20 of PCL in all plaques. This was most clear in early lesions, leading to near-complete regression. However, in mature plaques, and particularly in advanced plaques, despite a substantial decrease in CD68-positive cells between weeks 10 and 20, lesion size was mainly unaffected. Over this period, the plaque stability scores improved, but it is difficult to interpret the underlying biology of these changes. One plausible explanation is that macrophage death (necrosis) is responsible for the reduction of CD68-positive cells in advanced plaques; the lack of change in plaque size would reflect a larger necrotic core despite the lower number of macrophages. Another plausible explanation is that there are fewer but larger macrophages; however, since there could be many CD68 proteins/macrophage, this explanation seems less likely. Regardless, the plaque stability scores clearly coincided with the degree of regression, indicating that when all regression-induced compositional changes to the plaques were jointly considered (i.e., CD68-positive cells, lipid accumulation, collagenous matrix, and vascular smooth muscle cells), the remnants of mature and advanced plaques remained relative unstable after both 10 and 20 weeks of regression.

The mouse model used in this study is, in our opinion, the most relevant model for investigating atherosclerosis regression and associated changes in gene expression after PCL. First, these mice develop advanced atherosclerotic lesions on a normal chow diet and have a plasma lipid profile very similar to that of patients with familial hypercholesterolemia, who are highly susceptible to CAD [22,35]. Second, the high cholesterol levels in these mice can effectively be lowered after inducing expression of Mx1-Ge in the liver upon pI-pC treatments resulting in the recombination of Mito. This can be achieved at any time during lesion progression without affecting vitality [22]. Of note, however, unlike human atherosclerotic plaques those in mice rarely rupture [36].

There are other ways to induce atherosclerosis regression than by lowering “bad” LDL-cholesterol levels (the main form of “PCL” in the present study). It is also possible to overexpress ApoA1, the major apolipoprotein of HDL-cholesterol (“good” cholesterol), to enhance reverse cholesterol transport from the plaques to the liver. This strategy is motivated by the fact that plasma levels of HDL-cholesterol and ApoA1 in humans correlate inversely and independently with coronary heart disease [37,38]. Furthermore, in Apoe−/− mice, infusion of recombinant ApoA1 lowers lipid and macrophage levels in the plaque [39]. However, adenoviral transfer of ApoAI into Ldlr−/− mice has had inconsistent results [40–42]. In one study, preexisting atherosclerotic lesions regressed after ApoAI gene transfer [41]; however, in other studies, regression was not detected, but progression was slowed, and plaques in the aortic root had fewer macrophages and more collagen content [40,42]. Yet, the consensus is that increased levels HDL-cholesterol on top of LDL-cholesterol lowering could have additive effects on atherosclerosis regression and result in a more stable phenotype [39,42,43]. However, the plasma HDL-cholesterol levels in our study mice were reduced after PCL, which has also been shown by others [22], indicating that reverse cholesterol transport might not play a major role in the regression of atherosclerosis in our model.

Investigating transcriptional responses in the whole atherosclerotic arterial wall is not entirely trivial. As alluded to already, gene expression changes in the arterial wall may reflect gene activation (i.e., changes in the cellular mRNA concentrations) or changes in the cellular composition of the lesion. However, in our experience, it is vital to have data from the entire lesion, as many molecular processes are intermixed and depend on gene activity across cell types. The ideal situation would be to have mRNA profiles of single cell types (e.g., macrophages) together with the total mRNA profile of the same arterial wall. Unfortunately, this is not feasible in most instances. Another challenge of cell-type-specific mRNA profiles is to accurately distinguish different cell types before RNA isolation. This is especially difficult in

Table 3. Number of affected genes its respective network when the master regulatory TF were silenced with siRNA.

<table>
<thead>
<tr>
<th>Gene symbol</th>
<th>30 weeks</th>
<th>40 weeks</th>
<th>50 weeks</th>
</tr>
</thead>
<tbody>
<tr>
<td>PPARA</td>
<td>1</td>
<td>-</td>
<td>-</td>
</tr>
<tr>
<td>PPARG</td>
<td>15</td>
<td>-</td>
<td>-</td>
</tr>
<tr>
<td>ADORA2A</td>
<td>-</td>
<td>58</td>
<td>-</td>
</tr>
<tr>
<td>HMGB1</td>
<td>-</td>
<td>3</td>
<td>4</td>
</tr>
<tr>
<td>HMGB2</td>
<td>-</td>
<td>2</td>
<td>0</td>
</tr>
<tr>
<td>MLLS</td>
<td>-</td>
<td>15</td>
<td>4</td>
</tr>
<tr>
<td>SRSF10</td>
<td>-</td>
<td>-</td>
<td>71</td>
</tr>
<tr>
<td>XRN2</td>
<td>-</td>
<td>-</td>
<td>55</td>
</tr>
</tbody>
</table>

Table 4. Network specificity of the key master regulators using hypergeometric testing.

<table>
<thead>
<tr>
<th>Gene symbol</th>
<th>30 weeks</th>
<th>40 weeks</th>
<th>50 weeks</th>
</tr>
</thead>
<tbody>
<tr>
<td>PPARA</td>
<td>0.079</td>
<td>0.27</td>
<td>1.00</td>
</tr>
<tr>
<td>PPARG</td>
<td>0.020</td>
<td>0.15</td>
<td>1.00</td>
</tr>
<tr>
<td>HMGB2</td>
<td>1.00</td>
<td>1.00</td>
<td>1.00</td>
</tr>
<tr>
<td>ADORA2A</td>
<td>0.94</td>
<td>0.95</td>
<td>0.41</td>
</tr>
<tr>
<td>HMGB1</td>
<td>0.39</td>
<td>0.21</td>
<td>0.47</td>
</tr>
<tr>
<td>MLLS</td>
<td>0.76</td>
<td>0.0059</td>
<td>1.00</td>
</tr>
<tr>
<td>SRSF10</td>
<td>0.95</td>
<td>0.89</td>
<td>0.035</td>
</tr>
<tr>
<td>XRN2</td>
<td>0.91</td>
<td>0.58</td>
<td>0.040</td>
</tr>
</tbody>
</table>

doi:10.1371/journal.pgen.1004201.t003
atherosclerosis where, for example, smooth muscle cells sometimes change their phenotype and become macrophage-like cells [44]. In sum, as atherosclerotic lesions develop, different cell types become increasingly similar, sharing many phenotypes—a fact that favors the use of mRNA profiles from the entire lesion rather than from isolated cell types. However, since gene networks inferred from whole-lesion mRNA data will be incomplete and have missing nodes, it is essential to evaluate these networks in appropriate cell models of atherosclerosis, such as the THP-1 foam cell model we used in this study.

We also reasoned that the transcriptional profiles of blood macrophages isolated from CAD patients [29] would be most relevant for establishing the wiring diagram of the identified PCL-responsive mouse genes in TF-regulatory gene networks. This choice allowed us to understand mouse genes from the perspective of pathophysiological processes in humans [25,29,45] and to use a human foam cell culture model to validate the TF-regulatory networks, including their hubs (i.e., master regulators).

In summary, in this study we identified comprehensive compendia of atherosclerosis regression genes and discovered that the sensitivity of atherosclerosis to PCL depends on the stage of lesion progression. Our findings provide insight into PCL-responsive genes upstream of atherosclerosis regression and challenge aspects of our understanding of this clinically important event [13,15–23,33]. In particular, our findings emphasize the need to determine how PCL-responsive genes collectively initiate downstream regulation mechanisms, such as the TML pathway and possibly macrophage emigration and proliferation. Master regulators such as PPARG, MLL5, XRN2, and SRSF10 merit further study to determine the extent to which combinations of these genes can be activated or deactivated to achieve complete regression of advanced atherosclerotic lesions, with or without parallel PCL regimens.

### Materials and Methods

#### Ethics Statement

The use of human samples [29] in this study was approved by the Ethics Committee of Karolinska University Hospital. All patients gave written, informed consent. The animal studies were approved by Stockholm’s Norra Djurförsöknetsämnd, Sweden.

#### Mouse Model

*Lib*<sup>–/-</sup> *ApoB<sup>100/100</sup> Mttp<sup>lox/lox</sup>Mx1-Cre* mice have a plasma lipoprotein profile which resembles that of familial hypercholesterolemia and causes rapid atherosclerosis progression [22]. For *Mttp* deletion, mice were injected with 125 µl of pI-pC (1 µg/µl; Invivogen) every other day for 6 days to induce Cre expression and thereby *Mttp* recombination (*Mttp<sup>ΔA</sup>ΔA*). The mice were sacrificed 1, 10, or 20 weeks after *Mttp* depletion. Littermate controls received PBS (*Mttp<sup>lox/lox</sup>*). The study mice were backcrossed 5 times to C57BL/6 mice (<5% 129/SvJae and >95% C57BL/6), housed in a pathogen-free barrier facility (12-hour light/12-hour dark cycle), and fed rodent chow containing 4% fat. Plasma cholesterol (total and HDL) and triglyceride concentrations in fasting blood samples were determined with colorimetric assays (Infinity cholesterol/triglyceride kits; Thermo Scientific and HDL quantification colorimetric kit; BioVision), and plasma glucose levels with Precision Xtra (MediScience).

#### En Face Analysis and Histology

Aortas were pinned out flat on black wax surface as described [46], stained with Sudan IV, photographed with a Nikon SMZ1000 microscope, and analyzed with Easy Image Analysis 2000 software (Tekno Optik, Sweden). Lesion area was calculated as the percentage of the entire aortic surface between the aortic root and the iliac bifurcation. Aortic roots were isolated, immediately frozen in liquid nitrogen, embedded in OCT compound (Histolab, Sweden), cut into 10-µm sections, and stained with hematoxylin and Oil-Red-O (Sigma-Aldrich) for neutral lipids [47] or Picrosiarius Red (Sigma-Aldrich) for collagen as described [48]. Other sections were incubated first with rat anti-mouse CD68 antibody (Serotec) or rabbit anti-mouse SM22α (Abcam) overnight at 4°C and then with biotinylated secondary anti-rat IgG or anti-rabbit IgG antibodies (Vector Laboratories) and counterstained with hematoxylin (Sigma-Aldrich). Biotin emission was developed with diaminobenzidine (Vector Laboratories). Except for sections stained for collagen, which were photographed with a Leica DMIR microscope and a Leica DC480 color video camera, sections were photographed with an Apotome microscope (Carl Zeiss) and quantified with an AxioGraphic station (Carl Zeiss) at 50× magnification. For *en face* analysis, we examined aortas from 44 *Lib*<sup>–/-</sup> *ApoB<sup>100/100</sup> Mttp<sup>lox/lox</sup> mice (n = 12, 12, 8, 8, and 4 for weeks 20, 30, 40, 50, and 60, respectively) and 51 *Lib*<sup>–/-</sup> *ApoB<sup>100/100</sup> Mttp<sup>lox/lox</sup> ΔA mice (early lesions: n = 10 after 10 weeks and n = 6 after 20 weeks of PCL; mature lesions: n = 8 after both 10 and 20 weeks of PCL; advanced lesions: n = 9 and 10 after 10 and 20 weeks of PCL). The plaque stability score for each mouse was calculated as (SM22α+ collagen)/(CD68+Oil-Red-O) % areas [27] and normalized to plaque burden (lesion surface area). Missing data points (n = 19, 16%) were imputed with PROC MI in SAS version 9.3. The statistical significance of differences between time points was determined with two-tailed t tests.

### RNA Isolation and Global Gene Expression Profiling of Mouse Aortic Arch

Aortas were perfused with PBS and then with RNAlater (Qiagen), and the aortic arch (third rib to aortic root) was removed (to get RNA from the most atherosclerotic part of the aorta) and homogenized with FastPrep (Qbiogene). Total RNA was isolated with an RNeasy Mini-kit with a DNase I treatment step (Qiagen).

<table>
<thead>
<tr>
<th>Gene symbol</th>
<th>Control (relative CE levels)</th>
<th>siRNA knock (relative CE levels)</th>
<th>CE content (% relative control)</th>
<th>P value</th>
</tr>
</thead>
<tbody>
<tr>
<td>PPARG</td>
<td>100±9.0</td>
<td>112±13</td>
<td>+12</td>
<td>0.008</td>
</tr>
<tr>
<td>MLL5</td>
<td>100±17</td>
<td>121±20</td>
<td>+21</td>
<td>0.01</td>
</tr>
<tr>
<td>SRSF10</td>
<td>100±8.4</td>
<td>82.8±9.2</td>
<td>−17</td>
<td>0.0008</td>
</tr>
<tr>
<td>XRN2</td>
<td>100±12</td>
<td>85.2±17</td>
<td>−15</td>
<td>0.003</td>
</tr>
</tbody>
</table>

CE, cholesterol ester.

doi:10.1371/journal.pgen.1004201.t005

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Table 5. Effects of siRNA inhibition of the network top hubs on cholesterol-ester accumulation in a THP-1 foam cell model.
normalization, and summarizing of raw microarray data. The Robust Multichip Average algorithm in Affymetrix Power
macrophages was isolated with the RNeasy Mini-kit (Qiagen).

After 7 days, total RNA from adherent cells were given fresh RPMI 1640 medium supplemented as
removed, and the remaining monocyte/macrophage-enriched plates (BD Bioscience). The next day, nonadherent cells were
by density-gradient centrifugation and Ficoll-Paque Plus (Amer-
patients [29] were isolated from 80 ml of EDTA-treated blood
of the identified mouse gene sets (PCL-100/100 hours after siRNA transfection, cells were examined for effects on
progression/regression (rather than being reactive markers of disease development), eSNPs of the identified gene sets could be
enriched for CAD/MI risk. An eSNP indicates a functional relationship between the SNP and the expression of the identified
gene (within 1 Mb upstream and downstream of transcription start site) [29,54]. To investigate this, we first identified human orthologs of the differentially expressed mouse genes using HUGO Gene Nomenclature Committee’s (HGNC) Human and Mouse Ortho-
logous Gene Nomenclature and National Center for Biotechnology Information’s (NCBI) HomoloGene (Tables S8, S9, S10, S11, S12, S13). Enrichment of eSNPs with CAD/MI risk was determined with GWA data from MiGen [28]. eSNPs were identified from global genotype data (n = 156) and mRNA expression profiles of in
vitro differentiated blood macrophages [29]. eSNPs were expanded with SNPs in strong linkage disequilibrium (r²>0.9) within 200 kb of the eSNPs using HapMap. The expanded SNP sets for the causal gene sets consisted of 168, 511, and 1170 SNPs and the reactive
gene sets of 17, 276, and 1057 SNPs for 30, 40, and 50 weeks, respectively; overlapping SNPs between causal and reactive SNP sets were removed from the reactive SNP sets. A total of 5000 random samples of SNPs were used to determine whether the expanded SNP set was more likely to be associated with CAD/MI than randomly selected sets with the same characteristics (i.e., equal number of SNPs, chromosomal distribution, and minor allele frequency >5%). Finally, fold enrichment in risk was calculated as the ratio between the relative number of significant SNPs (P<0.05) in the expanded SNP set and the relative number of significant SNPs (P<0.05) in the random sets. MATLAB R2011a was used for all computations.

Regulatory Gene Network Reconstructions

TF-regulatory co-expression networks were reconstructed from global mRNA expression profiles from blood macrophages [29]. Regulatory gene networks were inferred from human homologs of causal mouse genes using the context likelihood of relatedness (CLR) method with Pearson correlation [55,56]. The CLR method computes the significance of a given regulator-target similarity score for a gene regulatory network. In brief, by using Pearson correlation, co-expression similarity between all gene pairs was computed and stored in a matrix, M [55]. Next, background corrections using positive z-scores were computed for each entry for M, considering both row and column values. Then, the joint likelihood of pairwise z-scores for each M was assessed [56]. TF-regulatory interactions used for the networks in early, mature, and advanced lesions had P values of <0.0051, <0.0013, and <0.00042, respectively, corresponding to the 50% most probable interactions in each network. CLR with Pearson correlation was implemented in C++. For each time point, the 10 most connected TFs are shown in the visualization of the networks with Cytoscape 2.8.2 [57].

siRNA Perturbation of THP-1 Macrophages Incubated with Ac-LDL

Human THP-1 monocytes were plated at 5×10^3 cells/well in six-well culture dishes (Becton Dickinson) containing 10% fetal calf
serum (FCS)-RPMI-1640 supplemented with PEST. The cells were incubated with PMA (50 ng/mL) (Sigma-Aldrich) for 72 hours to induce differentiation into macrophages and with Ac-LDL (50 μg/mL) for 48 hours to generate foam cells. Thereafter, for each master regulator, cells were transfected with siRNA (one at a time) (Ambion, Life Technologies, Table S17) using Lipofectamine 2000 as recommended by the manufacturer (Invitrogen), in medium without FCS, PEST, or PMA. Forty-eight hours after siRNA transfection, cells were examined for effects on

Global Gene Expression Profiles of Human Macrophages

Primary human monocytes from carotid endarterectomy patients [29] were isolated from 80 ml of EDTA-treated blood by density-gradient centrifugation and Ficoll-Paque Plus (Amer-

If the gene activity of the identified mouse gene sets (PCL-responsive and regression-reactive) are important for atherosclerosis

Global Gene Expression Profiles of Human Macrophages

Primary human monocytes from carotid endarterectomy patients [29] were isolated from 80 ml of EDTA-treated blood by density-gradient centrifugation and Ficoll-Paque Plus (Amer-

Analyses of Mouse Gene Expression Data

All samples were randomized and run simultaneously on the arrays at the Bioinformatics and Expression Analysis Core Facility at the Karolinska Institutet. Global mRNA expression data were pre-processed with the three-step Robust Multichip Average [49] procedure (background correction, quantile normalization, and summarization). No batch effects were detected that needed to be adjusted for. However, when comparing within groups of samples a few samples were considered outliers and excluded from further analyses. Groups of samples were compared by using differential expression (FDR<0.30) [50]. The FDR level was selected partly on the basis of sensitivity analysis [51] to capture an adequately large portion of the true-positive genes for the following downstream analysis. Mathatica 7.0 and 8.0 or R 2.9.2 “package: affy” was used for all calculations. Selected probe sets were annotated with NetAffx (Affymetrix) and DAVID [52,53]. Ingenuity Systems Pathway Analysis (IPA, www.ingenuity.com) was used to for functional analyses of sets of differentially expressed genes. The top bio-function categories—molecular and cellular functions and disease and disorders—were used.

CAD/MI Risk Enrichment Analyses Using the MiGen Genome-Wide Association Dataset

If the gene activity of the identified mouse gene sets (PCL-responsive and regression-reactive) are important for atherosclerosis
the expression of network genes (see section Gene Expression Measurements and Hypergeometric Testing for Network Specificity) and CE accumulation (see section Lipid and Protein Measurements).

Ac-LDL was prepared as described [58]. The samples were then dialyzed against PBS at 4°C. Ac-LDL protein concentration was determined by the Bradford method. LDL was isolated from plasma of healthy donors by sequential ultracentrifugation [59].

**Gene Expression Measurements and Hypergeometric Testing for Network Specificity**

For differential expression analyses and to determine the degree of silencing by siRNA (Table S17), total RNA was isolated from the targeted THP-1 foam cells with the RNAeasy Mini-kit (Qiagen). The concentration was determined by NanoDrop (Thermo Scientific). The degree of siRNA silencing was determined by TaqMan analyses (Table S17). cDNA was synthesized from 0.4 µg of total RNA with Superscript III (Invitrogen). Diluted cDNA was amplified by real-time PCR with 1×TaqMan universal PCR master mix (Applied Biosystems) according to the manufacturer’s protocol. Assay-On-Demand kits with corresponding primers and probes from Applied Biosystems were used (Table S17); samples were normalized with the comparative Ct method. mRNA expression profiles of targeted THP-1 foam cells were generated with Agilent Human Custom Gene Expression Microarray 8×15K, containing network genes (556 unique genes from the 30, 40, and 50 week networks) and TEML genes (116 TEML genes from DAVID (two of these 116 genes are present among the network genes) as well as three macrophage emigration genes (CCR7, LXR, and NTN), for a total 673 of unique genes (spotted on the 8×15K array). The concentration was determined by the Bradford method. CE accumulation was determined by the Bradford method. LDL was isolated from plasma of healthy donors by sequential ultracentrifugation [59].

Lipid and Protein Measurements

Lipids from siRNA-targeted THP-1-derived foam cells were isolated by extraction with hexane/isopropanol (3:2) at room temperature for 1 hour and then with 0.5 ml of chloroform for 15 min [60]. The lipids were dried and resuspended in isopropanol with 1% Triton-X-100 (Sigma-Aldrich). The lipid content of the foam cells was determined by enzymatic assays using the Infinity kit for total cholesterol (Thermo Scientific) and a kit for free cholesterol (Wako Chemicals). After lipid extraction, proteins were extracted from the same wells by incubation with 0.5 M sodium hydroxide for 5 hours at 37°C. Protein concentration was determined by the Bradford method. CE accumulation in the targeted THP-1 foam cells was calculated as total cholesterol – free cholesterol/protein concentration, relative to control.

**Supporting Information**

**Figure S1** A magnification of the TF regulatory network of PCL-responsive genes at week 40, shown in Figure 5B. Reds indicate that the TF is specific for its time-point network rather than expected by chance. yellows indicate that the TF is specific for its time-point network rather than expected by chance. Edges are connections between TFs and their first neighbor.

**Figure S2** A magnification of the TF regulatory network of PCL-responsive genes at week 40, shown in Figure 5C. Edges are connections between TFs and their first neighbor.

**Table S1** Plasma HDL-cholesterol concentrations in the study groups at sacrifice.

**Table S2** PCL-responsive genes at week 30.

**Table S3** PCL-responsive genes at week 40.

**Table S4** PCL-responsive genes at week 50.

**Table S5** Regression reactive genes at week 30.

**Table S6** Regression reactive genes at week 40.

**Table S7** Regression reactive genes at week 50.

**Table S8** Human orthologs for PCL-responsive mouse genes and network connections at week 30.

**Table S9** Human orthologs for PCL-responsive mouse genes and network connections at week 40.

**Table S10** Human orthologs for PCL-responsive mouse genes and network connections at week 50.

**Table S11** Human orthologs for Regression reactive mouse genes at week 30.

**Table S12** Human orthologs for Regression reactive mouse genes at week 40.

**Table S13** Human orthologs for Regression reactive mouse genes at week 50.

**Table S14** Functional enrichment using Ingenuity category Top Bio Function for PCL-responsive genes at week 30.

**Table S15** Functional enrichment using Ingenuity category Top Bio Function for PCL-responsive genes at week 40.

**Table S16** Functional enrichment using Ingenuity category Top Bio Function for PCL-responsive genes at week 50.
Table S16  Functional enrichment using Ingenuity category Top Bio Function for PCL-responsive genes at week 50. (XLSX)

Table S17  siRNA and TaqMan assays and the degree of siRNA inhibition. (XLSX)

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References

Author Contributions
Conceived and designed the experiments: JS JLM. Performed the experiments: JS RKJ CC MMS AR RT. Analyzed the data: JS SH HAT HFA OM TM. Contributed reagents/materials/analysis tools: AH. Wrote the paper: JS JLM.


